# Class 17 Vaccination Mini Project

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## Background

In this before Thanksgiving class when many of our class mates are traveling let's have a look at COVID-19 vaccination rates around the state.

We get vaccination rate data from CA.gov here: https://data.ca.gov/dataset/covid-19-vaccine-progress-dashboard-data-by-zip-code

### Import Data

```
vax <- read.csv("covid19vaccinesbyzipcode_test.csv")
head(vax)</pre>
```

```
as_of_date zip_code_tabulation_area local_health_jurisdiction
##
                                                                               county
## 1 2021-01-05
                                     92395
                                                      San Bernardino San Bernardino
## 2 2021-01-05
                                     93206
                                                                 Kern
                                                                                 Kern
## 3 2021-01-05
                                     91006
                                                          Los Angeles
                                                                         Los Angeles
## 4 2021-01-05
                                    91901
                                                            San Diego
                                                                            San Diego
## 5 2021-01-05
                                     92230
                                                            Riverside
                                                                            Riverside
## 6 2021-01-05
                                     92662
                                                                               Orange
                                                               Orange
##
     vaccine equity metric quartile
                                                      vem source
## 1
                                   1 Healthy Places Index Score
## 2
                                   1 Healthy Places Index Score
## 3
                                   3 Healthy Places Index Score
## 4
                                   3 Healthy Places Index Score
## 5
                                   1 Healthy Places Index Score
## 6
                                   4 Healthy Places Index Score
     age12_plus_population age5_plus_population persons_fully_vaccinated
##
## 1
                    35915.3
                                            40888
                                                                         NA
## 2
                     1237.5
                                             1521
                                                                         NA
## 3
                    28742.7
                                            31347
                                                                          19
## 4
                    15549.8
                                            16905
                                                                          12
## 5
                     2320.2
                                             2526
                                                                         NA
## 6
                     2349.5
                                             2397
     persons_partially_vaccinated percent_of_population_fully_vaccinated
##
## 1
## 2
                                NA
                                                                         NA
## 3
                               873
                                                                   0.000606
## 4
                               271
                                                                   0.000710
```

```
## 5
                                NA
                                                                        NA
## 6
                                NA
                                                                        NA
     percent_of_population_partially_vaccinated
##
## 1
## 2
                                        0.027850
## 3
## 4
                                        0.016031
## 5
                                              NA
## 6
                                              NA
##
     percent_of_population_with_1_plus_dose
## 2
                                          NA
## 3
                                    0.028456
                                    0.016741
## 4
## 5
                                          NA
## 6
                                          NA
##
                                                                    redacted
## 1 Information redacted in accordance with CA state privacy requirements
## 2 Information redacted in accordance with CA state privacy requirements
## 3
## 4
## 5 Information redacted in accordance with CA state privacy requirements
## 6 Information redacted in accordance with CA state privacy requirements
```

Q1. How many entries do we have?

### nrow(vax)

#### ## [1] 82908

We can use the **skimr** package and the **skim()** function to get a quick overview of the structure of this dataset.

skimr::skim(vax)

Table 1: Data summary

Name	vax
Number of rows	82908
Number of columns	14
Column type frequency: character	 5
numeric	9
Group variables	None

Variable type: character

skim_variable	n_missing	complete_rate	min	max	empty	n_unique	whitespace
as_of_date	0	1	10	10	0	47	0
local_health_jurisdiction	0	1	0	15	235	62	0
county	0	1	0	15	235	59	0
vem_source	0	1	15	26	0	3	0
redacted	0	1	$^2$	69	0	2	0

## Variable type: numeric

skim_variable	n_missin	$\mathbf{g}$ omplete_	_r <b>ante</b> an	$\operatorname{sd}$	p0	p25	p50	p75	p100	hist
zip_code_tabulation_area	0	1.00	93665.1	11817.39	90001	92257.7	593658.5	095380.5	097635.0	
vaccine_equity_metric_qu	art <b>ile</b> 89	0.95	2.44	1.11	1	1.00	2.00	3.00	4.0	
$age12\_plus\_population$	0	1.00	18895.0	418993.94	4 0	1346.95	13685.1	031756.1	288556.7	
$age5\_plus\_population$	0	1.00	20875.2	421106.04	4 0	1460.50	15364.0	034877.0	0101902.	0
persons_fully_vaccinated	8355	0.90	9585.35	11609.12	2 11	516.00	4210.00	16095.0	071219.0	
persons_partially_vaccinat	ed8355	0.90	1894.87	2105.55	11	198.00	1269.00	2880.00	20159.0	
percent_of_population_ful	lly <u>8</u> \$55cin	ated $0.90$	0.43	0.27	0	0.20	0.44	0.63	1.0	
percent_of_population_pa	rti <b>&amp;B</b> \$5_va	ccina <b>de9</b> D	0.10	0.10	0	0.06	0.07	0.11	1.0	
percent_of_population_wi	th <u>8<b>3</b>5</u> 5plus	s_do <b>0e</b> 90	0.51	0.26	0	0.31	0.53	0.71	1.0	

Notice that one of these columns is a date column. Working with time and dates gets annoying quickly. We can use the **lubridate** package to make this easy.

```
library(lubridate)
```

```
##
## Attaching package: 'lubridate'

## The following objects are masked from 'package:base':
##
## date, intersect, setdiff, union
```

```
#example lubridate function
today()
```

```
## [1] "2021-11-24"
```

Q2. How many days since the first entry in the dataset?

```
vax$as_of_date[1]
```

```
## [1] "2021-01-05"
```

```
#Change this to a date object and do math with today
today() - ymd(vax$as_of_date[1])
```

## Time difference of 323 days

```
#This works, so let's update the whole column
vax$as_of_date <- ymd(vax$as_of_date)</pre>
#Test that overwrite worked
today() - vax$as_of_date[1]
## Time difference of 323 days
     Q3. When was the dataset last updated? What is the last date in this dataset and how many
     days have passed since then?
     Q4. How many days does the dataset span?
#Last day
last_day <- vax$as_of_date[nrow(vax)]</pre>
last_day
## [1] "2021-11-23"
#Days since last day
today() - last_day
## Time difference of 1 days
#Span of data
last_day - vax$as_of_date[1]
## Time difference of 322 days
     Q5. How many different ZIP code areas are in this dataset?
#Saving the zip codes as factors might be useful in describing the data "by ZIP code" later
zip_factors <- as.factor(vax$zip_code_tabulation_area)</pre>
#Print how many different "levels" (ZIP codes) there are
length(levels(zip_factors))
## [1] 1764
```

To work with ZIP codes, we can use **zipcodeR** 

<chr>

<chr> <chr>

##

```
library(zipcodeR)

#example of using zipcodeR to pull up real world info about the ZIP codes
reverse_zipcode(c('92037', "92109"))

## # A tibble: 2 x 24

## zipcode zipcode_type major_city post_office_city common_city_list county state
```

<chr>

<blob> <chr> <chr>

```
## 1 92037
             Standard
                          La Jolla
                                     La Jolla, CA
                                                            <raw 20 B> San D~ CA
## 2 92109
            Standard
                          San Diego San Diego, CA
                                                             <raw 21 B> San D~ CA
## # ... with 17 more variables: lat <dbl>, lng <dbl>, timezone <chr>,
      radius_in_miles <dbl>, area_code_list <blob>, population <int>,
       population_density <dbl>, land_area_in_sqmi <dbl>,
## #
       water area in sqmi <dbl>, housing units <int>,
      occupied housing units <int>, median home value <int>,
      median_household_income <int>, bounds_west <dbl>, bounds_east <dbl>,
## #
## #
       bounds north <dbl>, bounds south <dbl>
```

## Focus in on San Diego County

Changing track from ZIP codes for a moment. We want to subset the full vax data down to just San Diego County.

```
#Subset and check with base R
vax_san_diego_base <- vax[vax$county == "San Diego",]
nrow(vax_san_diego_base)</pre>
```

## [1] 5029

```
head(vax_san_diego_base)
```

```
as_of_date zip_code_tabulation_area local_health_jurisdiction
##
## 4 2021-01-05
                                     91901
                                                             San Diego San Diego
## 14 2021-01-05
                                     91902
                                                             San Diego San Diego
## 21 2021-01-05
                                     92011
                                                            San Diego San Diego
## 22 2021-01-05
                                      92055
                                                            San Diego San Diego
## 25 2021-01-05
                                     92067
                                                            San Diego San Diego
## 33 2021-01-05
                                      92081
                                                             San Diego San Diego
##
      vaccine_equity_metric_quartile
                                                       vem_source
## 4
                                    3 Healthy Places Index Score
## 14
                                    4 Healthy Places Index Score
## 21
                                    4 Healthy Places Index Score
## 22
                                          CDPH-Derived ZCTA Score
## 25
                                    4 Healthy Places Index Score
## 33
                                    2 Healthy Places Index Score
##
      age12_plus_population age5_plus_population persons_fully_vaccinated
## 4
                    15549.8
                                             16905
                                                                          12
## 14
                    16620.7
                                             18026
                                                                          22
## 21
                    20503.6
                                             23247
                                                                          NA
## 22
                    11548.0
                                             11654
                                                                          NA
## 25
                      6973.9
                                              7480
                                                                          11
## 33
                    25558.0
                                             27632
                                                                          14
##
      persons_partially_vaccinated percent_of_population_fully_vaccinated
## 4
                                                                    0.000710
                                271
## 14
                                374
                                                                    0.001220
## 21
                                 NΑ
                                                                          MΔ
## 22
                                 NA
                                                                          NA
## 25
                                241
                                                                    0.001471
## 33
                                346
                                                                    0.000507
##
      percent_of_population_partially_vaccinated
```

```
## 4
                                          0.016031
## 14
                                          0.020748
## 21
                                                NA
                                                NA
## 22
## 25
                                          0.032219
## 33
                                          0.012522
##
      percent_of_population_with_1_plus_dose
                                     0.016741
## 4
## 14
                                     0.021968
## 21
                                            NA
## 22
                                            NA
                                     0.033690
## 25
                                      0.013029
## 33
                                                                      redacted
##
## 4
                                                                             No
## 14
                                                                             No
## 21 Information redacted in accordance with CA state privacy requirements
## 22 Information redacted in accordance with CA state privacy requirements
## 25
                                                                             No
## 33
                                                                             No
```

Subsetting can get tedious and complicated when we have multiple criteria, so we can use the **dplyr** package.

#### library(dplyr)

```
##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
## filter, lag

## The following objects are masked from 'package:base':
##
intersect, setdiff, setequal, union
```

We will use the filter() function to do our subsetting since it is more robust. Focus in on San Diego County as before.

```
#Get San Diego entries and check
sd <- filter(vax, county=="San Diego")
nrow(sd)</pre>
```

## [1] 5029

More complicated subsetting:

Q6. What is the average vaccination rate of San Diego County as of yesterday?

```
as_of_date zip_code_tabulation_area local_health_jurisdiction
                                                                         county
## 1 2021-11-23
                                    92120
                                                            San Diego San Diego
## 2 2021-11-23
                                                            San Diego San Diego
                                    91962
## 3 2021-11-23
                                    92155
                                                            San Diego San Diego
## 4 2021-11-23
                                    92147
                                                            San Diego San Diego
## 5 2021-11-23
                                    91913
                                                            San Diego San Diego
## 6 2021-11-23
                                    92114
                                                            San Diego San Diego
                                                      vem_source
     vaccine_equity_metric_quartile
## 1
                                   4 Healthy Places Index Score
## 2
                                   3 Healthy Places Index Score
## 3
                                  NA
                                                 No VEM Assigned
## 4
                                  NA
                                                 No VEM Assigned
## 5
                                   3 Healthy Places Index Score
## 6
                                   2 Healthy Places Index Score
     age12_plus_population age5_plus_population persons_fully_vaccinated
## 1
                   26372.9
                                            28414
                                                                      21234
## 2
                     1758.7
                                             2020
                                                                        948
## 3
                      456.0
                                              456
                                                                         70
## 4
                      518.0
                                              518
                                                                         NA
## 5
                    43514.7
                                            50461
                                                                      37974
                    59050.7
                                            64945
                                                                      43708
     persons_partially_vaccinated percent_of_population_fully_vaccinated
## 1
                              3198
                                                                   0.747308
## 2
                               126
                                                                   0.469307
## 3
                                20
                                                                   0.153509
## 4
                                NA
                                                                         NA
## 5
                              6690
                                                                   0.752542
                                                                   0.673000
## 6
                              6261
     percent_of_population_partially_vaccinated
## 1
                                         0.112550
## 2
                                         0.062376
## 3
                                         0.043860
## 4
                                               NA
## 5
                                         0.132578
## 6
                                         0.096405
     percent_of_population_with_1_plus_dose
## 1
                                    0.859858
## 2
                                    0.531683
## 3
                                    0.197369
## 4
## 5
                                    0.885120
## 6
                                    0.769405
##
                                                                     redacted
## 1
                                                                           No
```

```
## 2
## 3
## 4 Information redacted in accordance with CA state privacy requirements
## 5
## 6
No
No
```

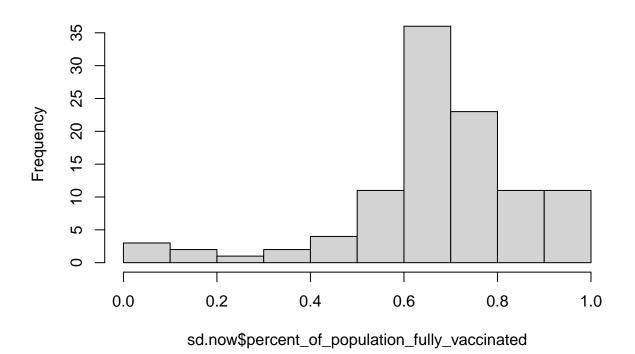
#Summary of vaccination percent, including mean
summary(sd.now\$percent\_of\_population\_fully\_vaccinated)

```
## Min. 1st Qu. Median Mean 3rd Qu. Max. NA's ## 0.01017 0.61301 0.67965 0.67400 0.76932 1.00000 3
```

Q7. Make a histogram of these values.

#Base R
hist(sd.now\$percent\_of\_population\_fully\_vaccinated)

## Histogram of sd.now\$percent\_of\_population\_fully\_vaccinated



However, this method skews for small counties (strong per-person effect on percentages).

- Q8. What is the population of the 92037 ZIP code (UCSD) area?
- Q9. What is the average vaccination value for this UCSD/La Jolla ZIP code area?

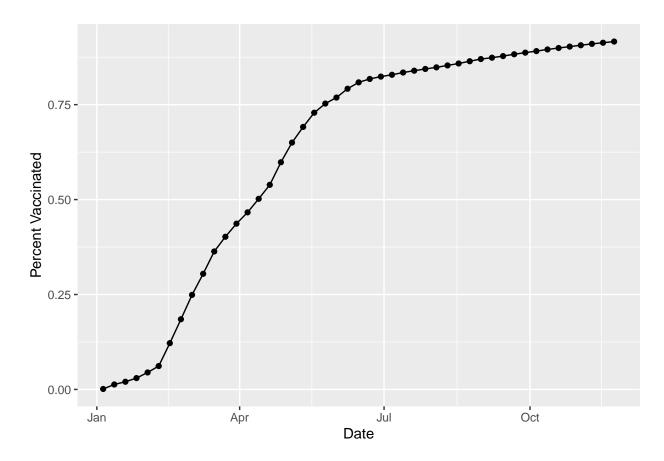
```
#Filter and view
lj <- filter(sd.now, zip_code_tabulation_area=="92037")</pre>
1j
     as_of_date zip_code_tabulation_area local_health_jurisdiction
##
## 1 2021-11-23
                                    92037
                                                          San Diego San Diego
##
     vaccine_equity_metric_quartile
## 1
                                  4 Healthy Places Index Score
##
     age12_plus_population age5_plus_population persons_fully_vaccinated
                                          36144
## 1
                   33675.6
    persons_partially_vaccinated percent_of_population_fully_vaccinated
##
## 1
                             7660
##
    percent_of_population_partially_vaccinated
## 1
                                         0.21193
##
    percent_of_population_with_1_plus_dose redacted
## 1
#Population and vaccination rate
lj$age5_plus_population
## [1] 36144
lj$percent_of_population_fully_vaccinated
## [1] 0.916196
    Q10. What about my Thanksgiving ZIP code?
home.vax <- filter(vax, zip_code_tabulation_area=="92882",
                 as_of_date=="2021-11-23")
#Percent Vaxxed
home.vax$age5_plus_population
## [1] 68310
home.vax$percent_of_population_fully_vaccinated
## [1] 0.564632
Time Course for Here and Home
Start with time course for 92037.
#load ggplot
```

here.by\_date <- filter(vax, zip\_code\_tabulation\_area=="92037")

library(ggplot2)

#filter for here (92037)

```
#plot here
ggplot(here.by_date) +
  aes(x=as_of_date, y=percent_of_population_fully_vaccinated) +
  geom_point() +
  geom_line(group=1) +
  labs(x="Date", y="Percent Vaccinated")
```



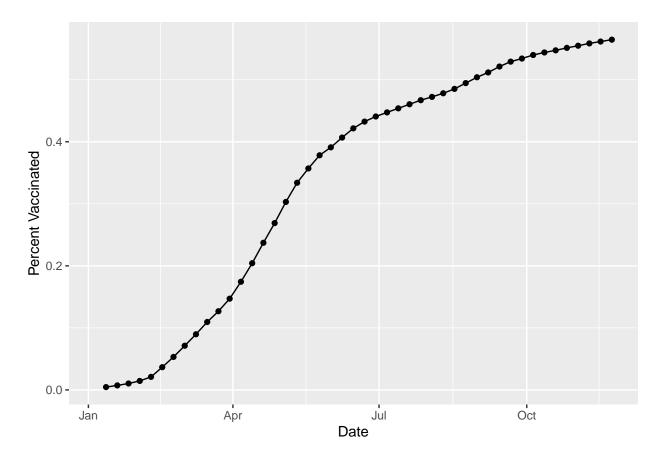
Repeat for Home (92882).

```
#filter for home (92882)
home.by_date <- filter(vax, zip_code_tabulation_area=="92882")

#plot here
ggplot(home.by_date) +
   aes(x=as_of_date, y=percent_of_population_fully_vaccinated) +
   geom_point() +
   geom_line(group=1) +
   labs(x="Date", y="Percent Vaccinated")</pre>
```

## Warning: Removed 1 rows containing missing values (geom\_point).

## Warning: Removed 1 row(s) containing missing values (geom\_path).



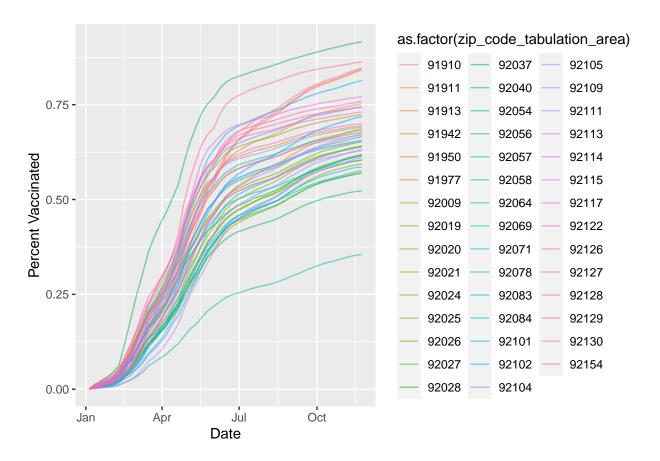
Let's compare across all of San Diego county.

Q11. How many ZIP codes pass this filter?

## [1] 44

```
#plot sd.large
ggplot(sd.large) +
  aes(x=as_of_date, y=percent_of_population_fully_vaccinated, col=as.factor(zip_code_tabulation_area),
  geom_line(alpha=0.5) +
  labs(x="Date", y="Percent Vaccinated")
```

## Warning: Removed 1 row(s) containing missing values (geom\_path).



Repeat for all of California.

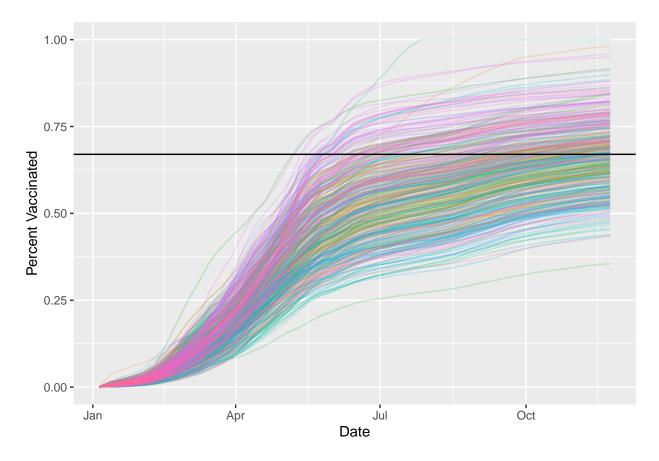
```
#filter for large zip codes
ca.large <- filter(vax, age5_plus_population >= 36144)

#how many ZIPs
length(levels(as.factor(ca.large$zip_code_tabulation_area)))
```

## [1] 412

```
#plot ca.large
ggplot(ca.large) +
  aes(x=as_of_date, y=percent_of_population_fully_vaccinated, col=as.factor(zip_code_tabulation_area),
  geom_line(alpha=0.2) +
  labs(x="Date", y="Percent Vaccinated") +
  theme(legend.position = "none") +
  geom_hline(yintercept = 0.67)
```

## Warning: Removed 176 row(s) containing missing values (geom\_path).



What is the mean across the state for these large pop ZIP codes?

```
#Filter for yesterday
ca.large.now <- filter(ca.large, as_of_date=="2021-11-23")

#Summary of vaccination percent, including mean
summary(ca.large.now$percent_of_population_fully_vaccinated)</pre>
```

```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 0.3552 0.5939 0.6698 0.6678 0.7350 1.0000
```